

Data Classification and Summarization with IBM Granite

Analisis Tren Pemakaian Obat di RSUD Kota Bandung Tahun 2015-2024 dengan IBM Granite

Oleh :

Safriella Salsabila Madania



01

Pendahuluan

Latar Belakang, Rumusan Masalah, dan Tujuan

03

Hasil dan Analisis



02

Metodologi

Sumber Data dan Teknik Analisis

04

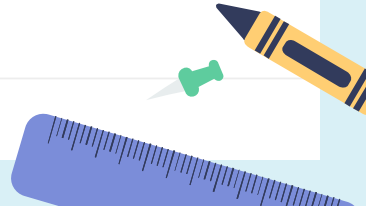
Kesimpulan

Pendahuluan

Latar Belakang, Rumusan Masalah, dan Tujuan



Latar Belakang

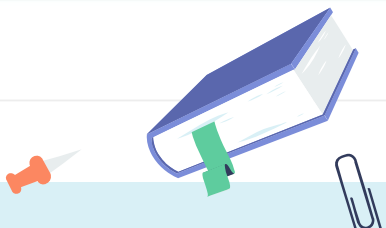
- Pemerintah berupaya mengendalikan biaya obat dengan menerbitkan berbagai peraturan terkait yaitu Permenkes No. HK 02.02/Menkes/O68/I/2010 pasal 8, tentang kewajiban menggunakan obat generik di fasilitas pelayanan kesehatan milik pemerintah serta program Jaminan Kesehatan Nasional (JKN) pada tahun 2014.
 - Analisis trend dari penggunaan obat yang didapatkan dapat memberikan informasi mengenai gambaran, evaluasi dan kegiatan terkait penggunaan obat di RSUD Bandung selama 2015 hingga 2024.
 - IBM Granite merupakan model dasar AI yang dikembangkan oleh IBM untuk aplikasi bisnis dengan kemampuan untuk berbagai tugas, termasuk analisis bahasa, kode, dan deret waktu.
- 



Rumusan Masalah

1. Bagaimana tren penggunaan obat generik vs non-generik dari tahun 2015–2024?
2. Bagaimana variasi pemakaian berdasarkan ruangan?
3. Bagaimana IBM Granite dapat membantu memberikan ringkasan dan rekomendasi dari data tersebut?

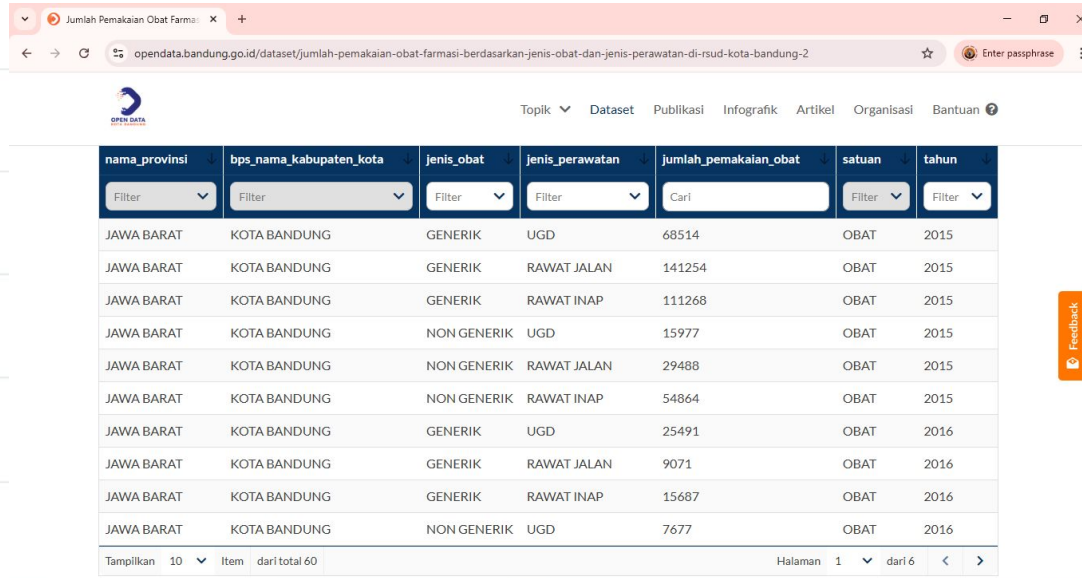
Tujuan

1. Mengklasifikasikan tren data pemakaian obat berdasarkan jenis dan tahun.
 2. Menganalisis perbandingan penggunaan obat antar ruangan.
 3. Menghasilkan ringkasan tren dan rekomendasi menggunakan IBM Granite.
- 

Sumber Data dan Teknik Analisis



Sumber Data



The screenshot shows a web browser window with the URL <https://opendata.bandung.go.id/dataset/jumlah-pemakaian-obat-farmasi-berdasarkan-jenis-obat-dan-jenis-perawatan-di-rsud-kota-bandung-2>. The page features a navigation bar with links: Topik, Dataset, Publikasi, Infografik, Artikel, Organisasi, and Bantuan. Below the navigation bar is a table with 7 columns: nama_provinsi, bps_nama_kabupaten_kota, jenis_obat, jenis_perawatan, jumlah_pemakaian_obat, satuan, and tahun. Each column has a filter dropdown menu. The table displays 10 rows of data. At the bottom of the table, there is a pagination bar showing 'Tampilkan 10 Item dari total 60' and 'Halaman 1 dari 6'.

nama_provinsi	bps_nama_kabupaten_kota	jenis_obat	jenis_perawatan	jumlah_pemakaian_obat	satuan	tahun
JAWA BARAT	KOTA BANDUNG	GENERIK	UGD	68514	OBAT	2015
JAWA BARAT	KOTA BANDUNG	GENERIK	RAWAT JALAN	141254	OBAT	2015
JAWA BARAT	KOTA BANDUNG	GENERIK	RAWAT INAP	111268	OBAT	2015
JAWA BARAT	KOTA BANDUNG	NON GENEIRK	UGD	15977	OBAT	2015
JAWA BARAT	KOTA BANDUNG	NON GENEIRK	RAWAT JALAN	29488	OBAT	2015
JAWA BARAT	KOTA BANDUNG	NON GENEIRK	RAWAT INAP	54864	OBAT	2015
JAWA BARAT	KOTA BANDUNG	GENERIK	UGD	25491	OBAT	2016
JAWA BARAT	KOTA BANDUNG	GENERIK	RAWAT JALAN	9071	OBAT	2016
JAWA BARAT	KOTA BANDUNG	GENERIK	RAWAT INAP	15687	OBAT	2016
JAWA BARAT	KOTA BANDUNG	NON GENEIRK	UGD	7677	OBAT	2016

<https://opendata.bandung.go.id/dataset/jumlah-pemakaian-obat-farmasi-berdasarkan-jenis-obat-dan-jenis-perawatan-di-rsud-kota-bandung-2>

Teknik Analisis



- **Dataset** : Pemakaian Obat di RSUD Kota Bandung Tahun 2015–2024 (.xlsx)
- **Analisis** :
 - Pandas (Python) → penggabungan data per tahun & per ruangan
 - IBM Granite → klasifikasi tren (increase, decrease, stable, fluctuation), ringkasan dan rekomendasi.
 - Matplotlib (Python) → Visualisasi line plot dan bar plot
- **Output** : Tabel, line plot dan bar plot, klasifikasi, ringkasan dan rekomendasi.



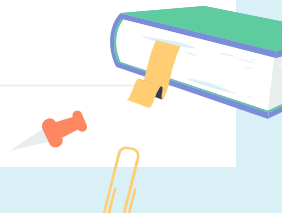


Analisis Tren

Pemakaian obat per tahun

Pemakaian obat per ruang perawatan

Pemakaian obat gabungan





Tahapan

Tahap 1 : Persiapan Lingkungan dan Instalasi	Instalasi dan import Library
Tahap 2 : Konfigurasi dan Autentikasi API	Ambil Token API dan inialisasi Model
Tahap 3 : Pemrosesan Data Awal	Load data dan pembersihan data
Tahap 4 : Analisis dan Agregasi Data	Agregasi data dan transformasi data
Tahap 5 : Klasifikasi dengan IBM Granite	Menyiapkan prompt dan mengirim ke Model
Tahap 6 : Visualisasi	Visualisasi data
Tahap 7 : Rekomendasi dengan IBM Granite	Menyiapkan prompt dan mengirim ke Model



The background is a light blue notepad with horizontal lines and a vertical margin on the left. Various school supplies are scattered around: a blue crayon, a magnifying glass, a yellow paperclip, a green starburst, a green spiral notebook, a yellow sticky note, a blue paperclip, a green crayon, a blue starburst, a fountain pen, and an orange cup. The text '03 Hasil dan Analisis' is centered in a dark blue font.

03

Hasil dan Analisis

Analisis Tren Pemakaian Obat per Tahun

1. Klasifikasi tren pemakaian obat per tahun

```
# --- Klasifikasi pemakaian obat per tahun ---  
# Klasifikasi data jumlah pemakaian obat per tahun dan jenis obat  
klasifikasi_tahun = df.groupby(["tahun", "jenis_obat"])["jumlah_pemakaian_obat"].sum().reset_index()  
print(klasifikasi_tahun)  
  
# Ubah tabel ke string untuk dimasukkan ke LLM  
tahun_str = klasifikasi_tahun.to_string(index=False)  
  
# Prompt untuk Granite  
prompt = f"""  
""  
Classify the trend of drug usage (increasing, decreasing, stable, fluctuating) for each year with format :  
year : ...  
  
Data:  
{tahun_str}  
"""  
  
# Kirim ke Granite  
result = ask_granite(prompt)  
print(result)
```

Analisis Tren Pemakaian Obat per Tahun

Output :

	tahun	jenis_obat	jumlah_pemakaian_obat
0	2015	GENERIK	321036
1	2015	NON GENEKIK	100329
2	2016	GENERIK	50249
3	2016	NON GENEKIK	19787
4	2017	GENERIK	85532
5	2017	NON GENEKIK	14410
6	2018	GENERIK	68383
7	2018	NON GENEKIK	8796
8	2019	GENERIK	72592
9	2019	NON GENEKIK	7774
10	2020	GENERIK	37513
11	2020	NON GENEKIK	3510
12	2021	GENERIK	345200
13	2021	NON GENEKIK	22083
14	2022	GENERIK	472717
15	2022	NON GENEKIK	25143
16	2023	GENERIK	557159
17	2023	NON GENEKIK	24744
18	2024	GENERIK	662562
19	2024	NON GENEKIK	109644
2015: Stable (both GENEKIK and NON GENEKIK show consistent usage without significant increase or decrease)			
2016: Decreasing (both GENEKIK and NON GENEKIK show a drop in usage from 2015)			
2017: Increasing (both GENEKIK and NON GENEKIK show an increase in usage from 2016)			
2018: Decreasing (both GENEKIK and NON GENEKIK show a drop in usage from 2017)			
2019: Increasing (both GENEKIK and NON GENEKIK show an increase in usage from 2018)			
2020: Decreasing (both GENEKIK and NON GENEKIK show a drop in usage from 2019, likely due to the global pandemic)			
2021: Increasing (both GENEKIK and NON GENEKIK show a significant rise in usage from 2020, possibly due to post-pandemic recovery)			
2022: Increasing (both GENEKIK and NON GENEKIK continue to show growth from 2021)			
2023: Increasing (both GENEKIK and NON GENEKIK show further growth from 2022)			
2024: Increasing (both GENEKIK and NON GENEKIK display substantial growth from 2023, with NON GENEKIK experiencing a more pronounced increase).			

Analisis Tren Pemakaian Obat per Tahun

2. Ringkasan dan rekomendasi pemakaian obat per tahun

```
# --- Analisis pemakaian obat per tahun ---  
# Klasifikasi data jumlah pemakaian obat per tahun dan jenis obat  
klasifikasi_tahun = df.groupby(["tahun", "jenis_obat"])["jumlah_pemakaian_obat"].sum().reset_index()  
  
# Ubah tabel ke string untuk dimasukkan ke LLM  
tahun_str = klasifikasi_tahun.to_string(index=False)  
  
# Prompt untuk Granite  
prompt = f"""  
"""  
Provide a summary, possible general reasons behind the changes, and brief recommendation in 3 sentences with points  
  
Data:  
{tahun_str}  
"""  
  
# Kirim ke Granite  
result = ask_granite(prompt)  
print(result)
```

Analisis Tren Pemakaian Obat per Tahun

Output :

Summary: The data shows a significant increase in the usage of both generic and non-generic medications from 2015 to 2024. However, generic medication usage has seen a more dramatic rise, with a steep surge in 2021 and an exponential growth in 2022, 2023, and 2024. Non-generic medication usage has consistently decreased since 2015, with a sharp drop observed in 2020 and a slight recovery in subsequent years.

Summary: The data shows a significant increase in the usage of both generic and non-generic medications from 2015 to 2024. However, generic medication usage has seen a more dramatic rise, with a steep surge in 2021 and an exponential growth in 2022, 2023, and 2024. Non-generic medication usage has consistently decreased since 2015, with a sharp drop observed in 2020 and a slight recovery in subsequent years.

Possible general reasons behind the changes:

1. Increased awareness and preference for generic medications due to their cost-effectiveness and perceived safety.
2. Policy changes or regulations promoting the use of generics over branded medications.
3. The impact of the COVID-19 pandemic, which might have affected production, distribution, or consumer behavior differently for generic and non-generic drugs.

Brief recommendation:

1. Encourage continued promotion of generic medications to maintain cost-effectiveness and accessibility in healthcare.
2. Investigate and address any potential supply chain or distribution issues affecting non-generic medications to prevent further decline.
3. Monitor trends and consumer behavior to adapt policies and strategies accordingly, ensuring a balanced market for both generic and non-generic medications.

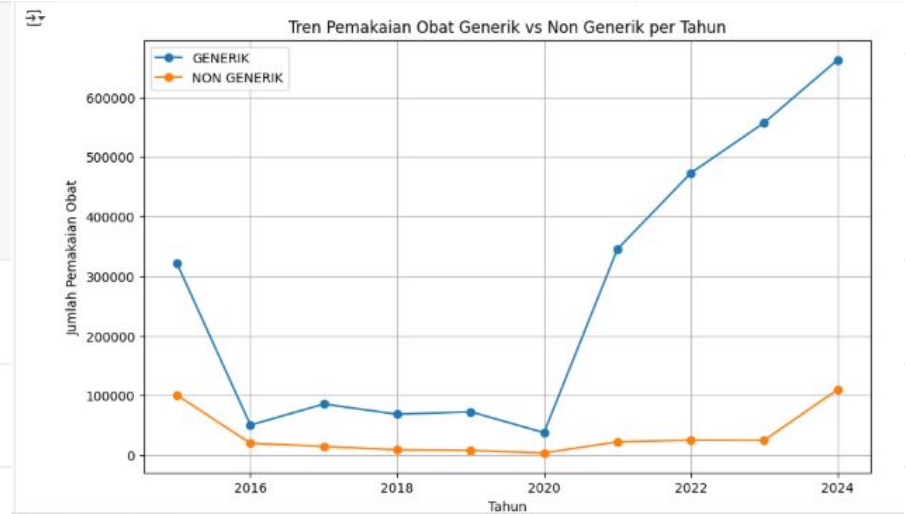
Analisis Tren Pemakaian Obat per Tahun

3. Visualisasi data pemakaian obat per tahun (line plot)

```
# Tren Line Pemakaian Obat per Tahun
import matplotlib.pyplot as plt

plt.figure(figsize=(10,6))
for jenis in klasifikasi_tahun["jenis_obat"].unique():
    subset = klasifikasi_tahun[klasifikasi_tahun["jenis_obat"] == jenis]
    plt.plot(subset["tahun"], subset["jumlah_pemakaian_obat"], marker="o", label=jenis)

plt.xlabel("Tahun")
plt.ylabel("Jumlah Pemakaian Obat")
plt.title("Tren Pemakaian Obat Generik vs Non Generik per Tahun")
plt.legend()
plt.grid(True)
plt.show()
```




Analisis Tren Pemakaian Obat per Jenis Perawatan

1. Klasifikasi tren pemakaian obat per jenis perawatan

```
# --- Klasifikasi per ruangan ---  
# Hitung total pemakaian obat per jenis_perawatan (ruangan) + jenis_obat  
klasifikasi_ruangan = df.groupby(["jenis_perawatan", "jenis_obat"])[  
    "jumlah_pemakaian_obat"].sum().reset_index()  
print(klasifikasi_ruangan)  
  
# Analisis per ruang  
ruang_str = klasifikasi_ruangan.to_string(index=False)  
  
# Prompt untuk Granite  
prompt = f"""  
Here is the drug usage data by hospital room type (inpatient, outpatient, emergency)  
and drug type (generic vs non-generic):  
  
{ruang_str}  
  
Please classify the room has the highest and lowest drug usage overall  
  
Data:  
{ruang_str}  
"""  
  
# Kirim ke Granite  
result = ask_granite(prompt)  
print(result)
```

Analisis Tren Pemakaian Obat per Jenis Perawatan

Output :



	jenis_perawatan	jenis_obat	jumlah_pemakaian_obat
0	RAWAT INAP	GENERIK	1188929
1	RAWAT INAP	NON GENERIK	156494
2	RAWAT JALAN	GENERIK	816061
3	RAWAT JALAN	NON GENERIK	103222
4	UGD	GENERIK	667953
5	UGD	NON GENERIK	76504

To determine the room type with the highest and lowest overall drug usage, we need to sum the usage for both generic and non-generic drugs within each room type.

1. ****RAWAT INAP (Inpatient):****
 - Generic: 1188929
 - Non-generic: 156494
 - Total: $1188929 + 156494 = 1345423$
2. ****RAWAT JALAN (Outpatient):****
 - Generic: 816061
 - Non-generic: 103222
 - Total: $816061 + 103222 = 919283$
3. ****UGD (Emergency):****
 - Generic: 667953
 - Non-generic: 76504
 - Total: $667953 + 76504 = 744457$

Comparing the totals:

- Highest overall drug usage: RAWAT INAP with 1345423
- Lowest overall drug usage: UGD with 744457

So, RAWAT INAP has the highest drug usage, and UGD (Emergency) has the lowest drug usage overall.

Analisis Tren Pemakaian Obat per Jenis Perawatan

2. Ringkasan dan rekomendasi pemakaian obat per jenis perawatan

```
[ ] # --- Analisis per ruangan ---  
# Hitung total pemakaian obat per jenis_perawatan (ruangan) + jenis_obat  
klasifikasi_ruangan = df.groupby(["jenis_perawatan", "jenis_obat"])["jumlah_pemakaian_obat"].sum().reset_index()  
  
# Analisis per ruang  
ruang_str = klasifikasi_ruangan.to_string(index=False)  
  
# Prompt untuk Granite  
prompt = f"""  
  
Provide a summary of the comparison across rooms and brief recommendation in 3 sentences with points  
  
Data:  
{ruang_str}  
"""  
  
# Kirim ke Granite  
result = ask_granite(prompt)  
print(result)
```

Analisis Tren Pemakaian Obat per Jenis Perawatan

Output :

The data shows the usage of generic and non-generic medications across different types of healthcare services:

1. For 'RAWAT INAP' (inpatient care), generic medications are used more frequently (1,188,929 times) compared to non-generic (156,494 times).
2. 'RAWAT JALAN' (outpatient care) also favors generic medications (816,061 times) over non-generic (103,222 times).
3. For 'UGD' (unspecified general diagnosis), generic medications are again preferred (667,953 times), with non-generic usage being less (76,504 times).

****Recommendation:****

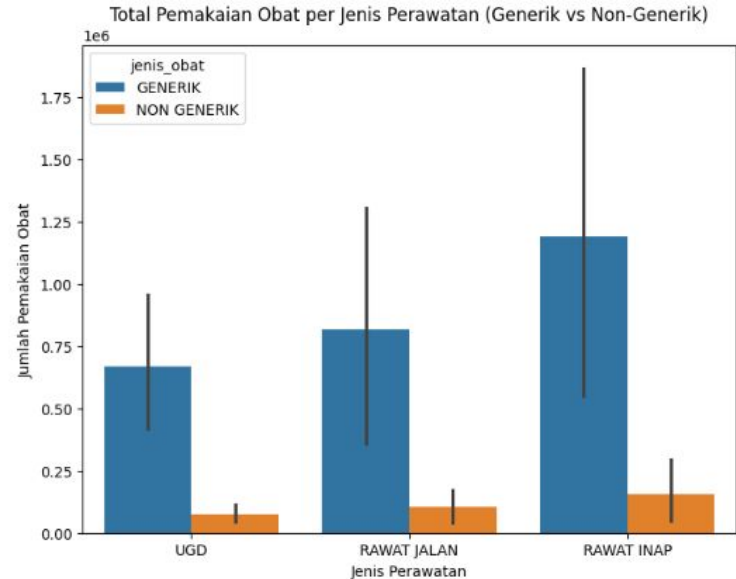
- Prioritize the procurement and usage of generic medications due to their significantly higher consumption rates across all categories (inpatient, outpatient, and unspecified general diagnosis).
- Review the necessity of non-generic medications, as their usage is considerably lower, to assess if cost-effective generic alternatives could be viable without compromising patient care.
- Implement strategies to increase the adoption of generic medicines, possibly through educational campaigns for both healthcare providers and patients about the efficacy and cost benefits of generics.

Analisis Tren Pemakaian Obat per Jenis Perawatan

3. Visualisasi data pemakaian obat per jenis perawatan (bar plot)

```
[ ] # Bagan akumulasi pemakaian obat berdasarkan jenis perawatan
plt.figure(figsize=(8,6))
sns.barplot(
    data=df,
    x="jenis_perawatan",
    y="jumlah_pemakaian_obat",
    hue="jenis_obat",
    estimator="sum"
)
plt.title("Total Pemakaian Obat per Jenis Perawatan (Generik vs Non-Generik)")
plt.ylabel("Jumlah Pemakaian Obat")
plt.xlabel("Jenis Perawatan")
plt.show()
```

4)



Analisis Tren Pemakaian Obat Gabungan

1. Ringkasan dan rekomendasi pemakaian obat

```
[ ] # --- Analisis gabungan ---  
# Klasifikasi data jumlah pemakaian obat per tahun, jenis perawatan, dan jenis obat  
gabungan = df.groupby(["tahun", "jenis_perawatan", "jenis_obat"])["jumlah_pemakaian_obat"].sum().reset_index()  
print(gabungan.head())  
  
# Ubah tabel ke string untuk dimasukkan ke LLM  
gabungan_str = gabungan.to_string(index=False)  
  
# Prompt untuk Granite  
prompt = f"""  
Summarize the usage trends of Generic and Non-Generic drugs across all rooms (inpatient, outpatient, and emergency) and years.  
Highlight major increases or decreases with the corresponding years.  
  
Data:  
{gabungan_str}  
"""  
  
# Kirim ke Granite  
result = ask_granite(prompt)  
print(result)
```

Analisis Tren Pemakaian Obat Gabungan

Output :

Summary of Generic and Non-Generic Drug Usage Trends

****Overall Trends:****

- ****Generic Drugs:**** There has been a consistent increase in the usage of generic drugs across all types of care (inpatient, outpatient, and emergency) from 2015 to 2024. The most significant growth is observed from 2020 to 2024, with a dramatic rise, especially in 2021 and 2022, indicating a strong shift towards generics.
- ****Non-Generic Drugs:**** Conversely, non-generic drug usage has seen a steady decline across all categories from 2015 to 2024. The decrease is most pronounced from 2020 onwards, aligning with the surge in generic drug usage.

Analisis Tren Pemakaian Obat Gabungan

Output :

****Year-by-Year Highlights:****

- ****2015:**** Initial data shows a higher usage of non-generic drugs across all categories, with inpatient care (RAWAT INAP) having the highest numbers for both generic and non-generic drugs.
- ****2020:**** A notable drop in non-generic drug usage across all categories, coinciding with the beginning of a significant increase in generic drug usage, particularly in outpatient (RAWAT JALAN) and emergency (UGD) services.
- ****2021:**** A massive increase in generic drug usage, especially in inpatient (RAWAT INAP) and outpatient (RAWAT JALAN) care, reflecting a substantial shift in prescription practices. Non-generic usage continues its downward trend.
- ****2022:**** Continued growth in generic drug usage, with inpatient and outpatient services showing the highest numbers. Non-generic usage remains low.
- ****2023:**** Further escalation in generic drug usage, with all categories showing substantial numbers. Non-generic usage remains minimal.
- ****2024:**** The trend of increasing generic drug usage persists, with the highest numbers recorded for both inpatient (RAWAT INAP) and outpatient (RAWAT JALAN) care, as well as emergency (UGD) services. Non-generic usage is significantly reduced, with only minor figures across all categories.

Analisis Tren Pemakaian Obat Gabungan

Output :

```

tahun jenis_perawatan jenis_obat jumlah_pemakaian_obat
0 2015 RAWAT INAP GENERIK 111268
1 2015 RAWAT INAP NON GENERIK 54864
2 2015 RAWAT JALAN GENERIK 141254
3 2015 RAWAT JALAN NON GENERIK 29488
4 2015 UGD GENERIK 68514
### Summary of Generic and Non-Generic Drug Usage Trends

```

Overall Trends:

- **Generic Drugs:** There has been a consistent increase in the usage of generic drugs across all types of care (inpatient, outpatient, and emergency) from 2015 to 2024. The most significant growth is observed from 2020 onwards, aligning with the surge in generic drug usage.
- **Non-Generic Drugs:** Conversely, non-generic drug usage has seen a steady decline across all categories from 2015 to 2024. The decrease is most pronounced from 2020 onwards, aligning with the surge in generic drug usage.

Year-by-Year Highlights:

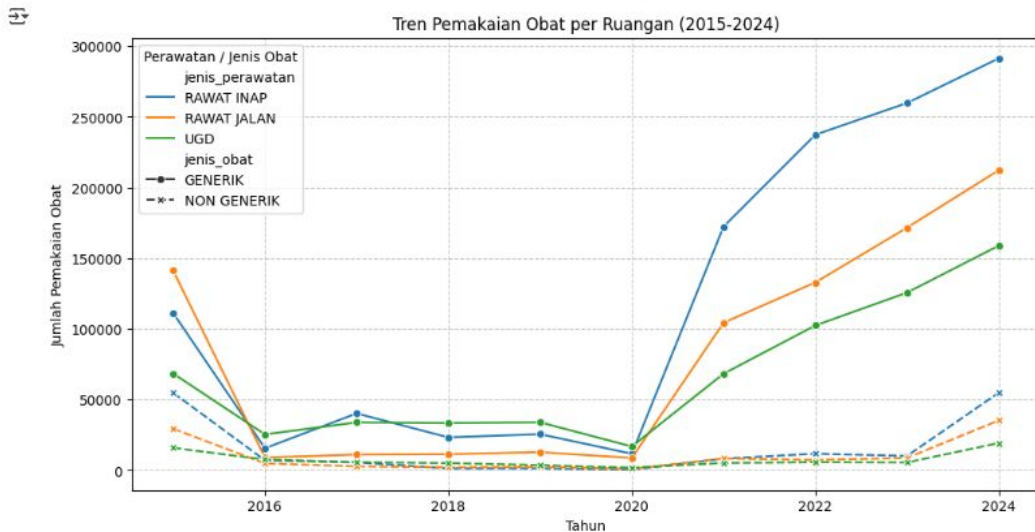
- **2015:** Initial data shows a higher usage of non-generic drugs across all categories, with inpatient care (RAWAT INAP) having the highest numbers for both generic and non-generic drugs.
- **2020:** A notable drop in non-generic drug usage across all categories, coinciding with the beginning of a significant increase in generic drug usage, particularly in outpatient (RAWAT JALAN) and emergency (UGD) services.
- **2021:** A massive increase in generic drug usage, especially in inpatient (RAWAT INAP) and outpatient (RAWAT JALAN) care, reflecting a substantial shift in prescription practices. Non-generic usage continues its downward trend.
- **2022:** Continued growth in generic drug usage, with inpatient and outpatient services showing the highest numbers. Non-generic usage remains low.
- **2023:** Further escalation in generic drug usage, with all categories showing substantial numbers. Non-generic usage remains minimal.
- **2024:** The trend of increasing generic drug usage persists, with the highest numbers recorded for both inpatient (RAWAT INAP) and outpatient (RAWAT JALAN) care, as well as emergency (UGD) services. Non-generic usage remains at its lowest point.

Analisis Tren Pemakaian Obat Gabungan

2. Visualisasi data pemakaian obat gabungan (line plot)

```
# Trend line gabungan pemakaian obat berdasarkan tahun, jenis obat, dan jenis perawatan
# Hitung total pemakaian obat per tahun, jenis obat, dan jenis perawatan
gabungan = df.groupby(["tahun", "jenis_perawatan", "jenis_obat"])["jumlah_pemakaian_obat"].sum().reset_index()

# Grafik gabungan semua ruangan
plt.figure(figsize=(12, 6))
sns.lineplot(data=gabungan, x="tahun", y="jumlah_pemakaian_obat",
             hue="jenis_perawatan", style="jenis_obat", markers=True)
plt.title("Tren Pemakaian Obat per Ruang (2015-2024)")
plt.xlabel("Tahun")
plt.ylabel("Jumlah Pemakaian Obat")
plt.grid(True, linestyle="--", alpha=0.7)
plt.legend(title="Perawatan / Jenis Obat")
plt.show()
```

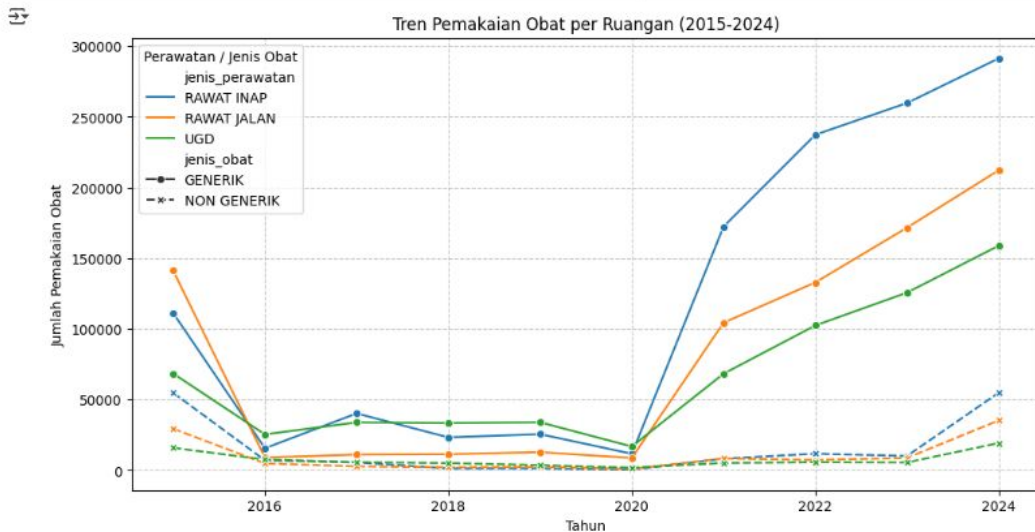


Analisis Tren Pemakaian Obat Gabungan

2. Visualisasi data pemakaian obat gabungan (line plot)

```
# Trend line gabungan pemakaian obat berdasarkan tahun, jenis obat, dan jenis perawatan
# Hitung total pemakaian obat per tahun, jenis obat, dan jenis perawatan
gabungan = df.groupby(["tahun", "jenis_perawatan", "jenis_obat"])["jumlah_pemakaian_obat"].sum().reset_index()

# Grafik gabungan semua ruangan
plt.figure(figsize=(12, 6))
sns.lineplot(data=gabungan, x="tahun", y="jumlah_pemakaian_obat",
             hue="jenis_perawatan", style="jenis_obat", markers=True)
plt.title("Tren Pemakaian Obat per Ruang (2015-2024)")
plt.xlabel("Tahun")
plt.ylabel("Jumlah Pemakaian Obat")
plt.grid(True, linestyle="--", alpha=0.7)
plt.legend(title="Perawatan / Jenis Obat")
plt.show()
```



Analisis Tren Pemakaian Obat Gabungan

2. Rekomendasi data pemakaian obat gabungan

```
# Rekomendasi
# Ubah tabel ke string untuk dimasukkan ke LLM
gabungan_str = gabungan.to_string(index=False)

# Prompt untuk Granite
prompt = f"""
Based on the combined drug usage trends across all rooms and drug types,
provide 3 key recommendations for hospital management to optimize drug usage.
Focus on efficiency, cost-effectiveness, and patient care with 3 sentences.

Data:
{gabungan_str}
"""

# Kirim ke Granite
result = ask_granite(prompt)
print(result)
```

Analisis Tren Pemakaian Obat Gabungan

Output :

1. Prioritize the use of generic drugs to enhance cost-effectiveness, as evidenced by the consistent preference for generics across all categories, significantly reducing expenses without compromising patient care.
2. Implement targeted training programs for medical staff to optimize drug prescription practices, focusing on the appropriate use of non-generic drugs when necessary, ensuring patient care remains uncompromised while minimizing unnecessary costs.
3. Analyze room-specific drug usage trends to identify areas for improvement in resource allocation, such as focusing on reducing non-generic drug use in rooms with high outpatient (RAWAT JALAN) and UGD activity, thereby enhancing overall efficiency and cost-effectiveness.

Analisis Tren Pemakaian Obat Gabungan

Output :

1. Prioritize the use of generic drugs to enhance cost-effectiveness, as evidenced by the consistent preference for generics across all categories, significantly reducing expenses without compromising patient care.
2. Implement targeted training programs for medical staff to optimize drug prescription practices, focusing on the appropriate use of non-generic drugs when necessary, ensuring patient care remains uncompromised while mir
3. Analyze room-specific drug usage trends to identify areas for improvement in resource allocation, such as focusing on reducing non-generic drug use in rooms with high outpatient (RAMAT JALAN) and UGD activity, thereby

04

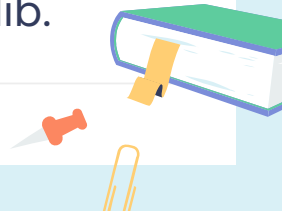
Kesimpulan





Kesimpulan

- IBM Granite dapat digunakan untuk mengklasifikasikan tren penggunaan obat, baik berdasarkan jenis perawatan maupun periode waktu.
- Model ini mampu membuat ringkasan dari data, sehingga memudahkan dalam memahami pola yang terjadi.
- IBM Granite juga bisa memberikan rekomendasi umum terkait perubahan tren yang ditemukan.
- Hasil menunjukkan Granite cukup efektif sebagai pendukung analisis data ketika digunakan bersama tools Python seperti pandas dan matplotlib.



**Terima
Kasih**

